



## REAL-TIME NEURAL NETWORKS FOR UTILITY BOILERS

### Real-Time Neural Networks for Combustion Optimization of Utility Boilers Reduce Emissions

#### Benefits

- ◆ Reduces need for new power plants for utility expansion projects, thus reducing associated impacts on land and water
- ◆ Improved heat rate means more electricity is produced per unit of CO<sub>2</sub> and SO<sub>x</sub> emitted
- ◆ Reduces NO<sub>x</sub> emissions by 20% to 60% while maintaining or improving plant thermal efficiency and reducing SO<sub>x</sub> and CO<sub>2</sub> emission levels
- ◆ Has saved 6.2 trillion Btu in 2000 from 31 operating systems
- ◆ Has saved 20.4 trillion Btu and more than \$35 million in energy costs cumulatively through 2000

#### Applications

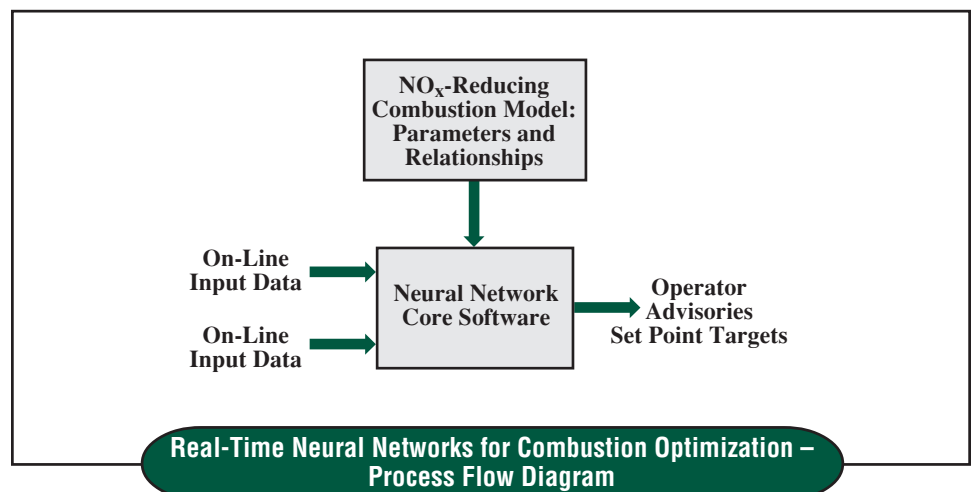
Real-time neural networks can be used by coal-, oil-, and gas-fired boilers, particularly those with capacities of 25 MW or greater.

Three major air pollutants from power plants are nitrogen oxide (NO<sub>x</sub>), sulfur dioxide (SO<sub>2</sub>), and carbon dioxide (CO<sub>2</sub>). The U.S. Environmental Protection Agency (EPA) has identified NO<sub>x</sub> and SO<sub>2</sub> as contributors to smog, health problems, and acid rain and has issued regulations to control NO<sub>x</sub> and SO<sub>2</sub> emissions. CO<sub>2</sub> is thought to be the major cause of global climate change.

A new technology is helping utilities cut costs related to reducing emissions from coal-fired electric power plants. Pegasus Technologies Inc. of Mentor, Ohio, has developed the NeuSIGHT system to cut NO<sub>x</sub>, SO<sub>2</sub>, and CO<sub>2</sub> emissions. The NeuSIGHT system, which employs closed-loop supervisory control in real time, can improve power plant operation by increasing operating efficiency and reducing emissions.

According to Willie Roland, Pegasus' project manager, "Reduced emissions and higher operating efficiency are becoming increasingly important in the utility sector. We have integrated the latest advances in artificial intelligence, sensors, and control technologies into a system that allows utilities to automatically fine-tune operation of their power plants to both reduce emissions and improve performance. And NeuSIGHT does it very cost-effectively."

Pegasus has found that its system reduces NO<sub>x</sub> emissions from coal-fired power plants by the same amount as a low-NO<sub>x</sub> burner retrofit on some units. Low-NO<sub>x</sub> burner retrofits cost approximately \$5 million for a large coal-fired power plant—twenty times the cost of the NeuSIGHT system.





## Funding for a Cost-Competitive Future

In 1994 Pegasus received a \$100,000 grant under the U.S. Department of Energy's (DOE's) NICE<sup>3</sup> (National Industrial Competitiveness through Energy, Environment, and Economics) Program to modify its heat rate improvement advisory system to include closed-loop supervisory control for reducing NO<sub>x</sub> and improving heat rates. Pegasus combined the NICE<sup>3</sup> grant with its own investment to develop and demonstrate an integrated system that allows real-time responses to reduce pollutant emissions. Ohio Edison and the Ohio Department of Development's Office of Energy Efficiency also contributed funds to the project.

## Improved Control Systems

Advances in computer technology and the science of neural networks and other artificial intelligence technologies made it possible for Pegasus to develop "smart" controls to reduce emissions at the source. Instead of using traditional linear models, this system applies nonlinear models that rapidly analyze "what-if" situations with as many as 120 variables. These analyses determine the appropriate combustion set points needed to reduce emissions to the desired level.

The NeuSIGHT system carries the "smart" control one step further—the models automatically update themselves based on information learned from power plant boiler operation. "The real advantage of neural networks," noted Roland, "is that they are interactive and permit real-time responses." The networks use a pattern-recognition method that allows the system to adjust quickly to real-time operations rather than relying on rigid methods based on textbook calculations or static models.

For power plants without existing emissions controls, Pegasus estimates that its system will reduce NO<sub>x</sub> emissions by 20% to 60% (typically 25% to 35%). When NeuSIGHT is added, plants that have already been fitted with low-NO<sub>x</sub> burners typically experience a further reduction of 10% to 40% in NO<sub>x</sub> emissions. One NeuSIGHT system installed in a power plant with low-NO<sub>x</sub> burners achieved NO<sub>x</sub> levels as low as 0.13 lb/million Btu. In addition, improved heat rate means that more electricity is produced per unit of CO<sub>2</sub> and SO<sub>2</sub> emitted, so emissions of these pollutants decrease as well. Pegasus has estimated that its system can improve heat rate from 0.5% to 5%, which translates into an equivalent reduction in CO<sub>2</sub> and SO<sub>2</sub> emissions. According to Roland, "The NICE<sup>3</sup> grant allowed us to add the key emissions control capability to our system. Once the utilities saw that it worked with minimum maintenance costs, they were willing to start placing their orders."

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**—Willie Roland  
Pegasus Project Manager**



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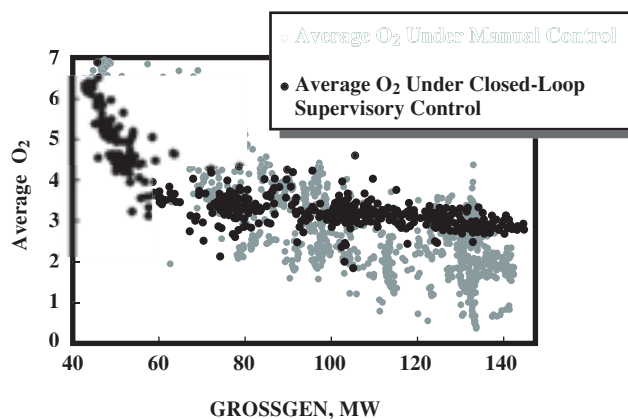
### Project Partners

- ◆ Ohio Department of Development  
Columbus, OH
- ◆ Ohio Edison  
Akron, OH
- ◆ Pegasus Technologies Inc.  
Mentor, OH

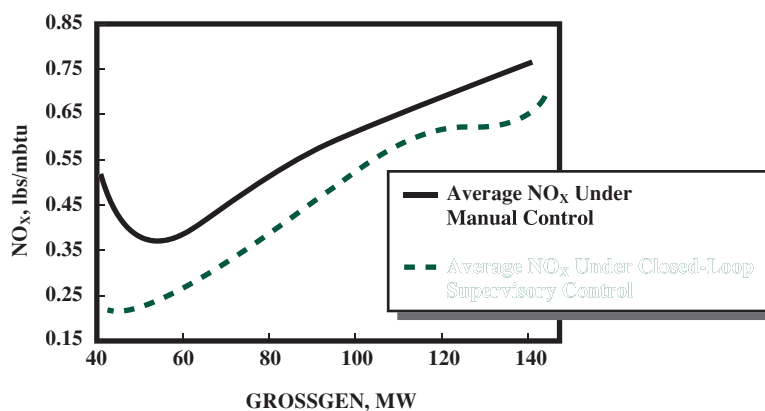
### Demonstrated Sales Success and Recognition

In October 1995 Ohio Edison fired up its first NeuSIGHT system, installed on a vintage 145-megawatt (MW) coal-fired plant. The system reduced NO<sub>x</sub> emissions about 15% at full load and as much as 60% at low load. The overall unit heat rate improved 1.3%. The second system, installed on Dayton Power and Light's 650-MW Killen plant, was successfully demonstrated in 1997. After these demonstrations were successfully completed, sales began to take off. Pegasus has sold 37 units, of which 31 are still operating. These units are not only reducing air emissions but are also saving 0.2 trillion Btu/year per unit for a total of 6.2 trillion Btu/year.

**GROSSGEN vs. Average O<sub>2</sub> Plot**  
Manual Control vs. Closed-Loop Supervisory Control



**GROSSGEN vs. NO<sub>x</sub> Plot**  
Manual Control vs. Closed-Loop Supervisory Control



**NeuSIGHT Optimizes Combustion  
and Lowers NO<sub>x</sub> Emissions**



**Table 1.** *Estimated Annual Reductions from Efficiency Improvements (200 Installations)*

Fuel/Effluent	Reduction (tons/yr)
Coal Consumption	1.13 M*
CO <sub>2</sub> Emissions	4.68 M
NO <sub>x</sub> Emissions	472,500
SO <sub>2</sub> Emissions	45,000
Particulates	6,200

\* Saving 45 trillion Btu/yr.

With electric utility deregulation and tighter air quality regulations, Roland expects as many as 200 systems will be installed in power plants in the next five years. An average unit in the utility industry is 400 MW with a 60% capacity factor. With an improvement in efficiency of 1% and an NO<sub>x</sub> reduction of 20%, the 200 installations would experience the reduced coal consumption and effluent emissions provided in Table 1.

Pegasus forecasts that 37% of the U.S.-pulverized coal plants and 25% of plants worldwide will use neural network systems by 2010. Additional environmental benefits will result from reduced coal-mining, transportation, processing, and combustion waste disposal.

## System Economics and Market Potential

Pegasus estimates a simple 6-month to 1-year payback period based on reduced fuel consumption. In some cases investments in selective catalytic or noncatalytic reduction equipment needed to comply with required NO<sub>x</sub> levels can be avoided or deferred, resulting in a large economic benefit.

An even broader market for the Pegasus technology includes optimized soot blowing, improved multivalve point turbine control, decreased electrostatic precipitator power usage, and decreased limestone usage in SO<sub>2</sub> scrubbers. The technology can also be vertically integrated for system-wide asset management supporting activities such as equipment diagnostics and maintenance, inventory management, and load dispatching. Other applications include industrial boilers in several industries: petroleum; chemical; pulp and paper; pharmaceutical; food and beverage; primary metal; plastic; textile; and stone, clay, and glass industries. Pegasus has conducted trial runs of the system installed on a boiler fueled with municipal solid waste—another potential market.

Pegasus has actively marketed the NeuSIGHT system. Publications about the system have appeared in several industry journals. Since successfully demonstrating the technology under the NICE<sup>3</sup> grant program, Pegasus has made more than 70 presentations and presented 14 conference papers on the system.

In recognition of the success of its innovative technology, Pegasus received DOE's Office of Industrial Technologies Commercialization Achievement Award in 1996 for its outstanding leadership in developing and commercializing a new combustion control technology.



**NICE<sup>3</sup> – National Industrial Competitiveness through Energy, Environment, and Economics:**  
An innovative, cost-sharing program to promote energy efficiency, clean production, and economic competitiveness in industry. This grant program provides funding to state and industry partnerships for projects that demonstrate advances in energy efficiency and clean production technologies. Awardees receive a one-time grant of up to \$525,000. Grants fund up to 50% of total project cost for up to 3 years.

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